Vision Research 50 (2010) 1656-1664

Contents lists available at ScienceDirect

**Vision Research** 

journal homepage: www.elsevier.com/locate/visres

# Is there a general trait of susceptibility to simultaneous contrast?

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## ARTICLE INFO

Article history: Received 26 February 2010 Received in revised form 30 April 2010

Keywords: Simultaneous contrast Individual differences Lateral interactions Colour Constancy

#### 1. Introduction

Many visual attributes exhibit simultaneous contrast. It occurs in stimuli embedded spatially in a related context: the appearance of the embedded stimulus is shifted away from that of the surround. Since simultaneous contrast across disparate stimulus dimensions may plausibly share a common neural mechanism, individuals who are particularly susceptible to one contrast effect may be particularly susceptible to them all. To address this possibility we studied individual differences in the extent to which simultaneous contrast is perceived across multiple stimulus dimensions. We measured susceptibility to simultaneous contrast across ten different stimulus dimensions: luminance contrast (Diamond, 1953), colour contrast (Kirschmann, 1891), luminance contrast contrast (Chubb, Sperling, & Solomon, 1989), colour contrast contrast (Singer & D'Zmura, 1994), motion contrast (Duncker, 1938), orientation contrast (Westheimer, 1990), spatial frequency contrast (Klein, Stromeyer, & Ganz, 1974) and numerosity contrast (Durgin, 2002; MacKay, 1973).

Explanations for simultaneous contrast have been offered within different frameworks and at different levels. One tradition, classically identified with Hering (1920), offers a physiological account, in terms of neural interactions. Another, classically identified with Helmholtz, offers a cognitive account in terms of the most likely interpretation of the scene. These different levels of explanation are not necessarily exclusive (Kingdom, 1997).

Recent physiological and anatomical approaches to simultaneous contrast have focused on extra-classical receptive fields. Ex-

## ABSTRACT

Individuals differ in their susceptibility to simultaneous contrast. Are the underlying differences in neural machinery conserved across different stimulus dimensions? We measured the extent to which 101 subjects perceived simultaneous contrast on the dimensions of luminance, colour, luminance contrast, colour contrast, orientation, spatial frequency, motion and numerosity. Individual differences showed re-test reliability for each dimension ( $0.32 \leq ICC(c,1) \leq 0.78$ ,  $p \leq 0.05$ ), but susceptibility to simultaneous contrast, with a few exceptions, was not correlated across dimensions. Either susceptibility to contrast arises empirically from an individual's interactions with the environment, or it is genetically determined but independently for different dimensions.

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tra-classical receptive fields are defined by the non-linear response to stimuli in the surround: a neuron's level of activation is modulated by a stimulus in its extra-classical receptive field only if there is a stimulus concurrently in its classical receptive field. The presence of extra-classical receptive fields shows that the neural machinery exists for an influence of spatial context. Their existence has been reported at many levels of the visual system including the retina (Cleland & Levick, 1974; Solomon, Lee, & Sun, 2006), the Lateral Geniculate Nucleus (LGN) (Felisberti & Derrington, 2001; Levick, Cleland, & Dubin, 1972), cortical area V1 (Fitzpatrick, 2000; Maffei & Fiorentini, 1976), and cortical area V5 (Allman, Miezin, & McGuinness, 1985; Born, 2000). What neural circuitry gives rise to the extra-classical receptive field is still debated. Candidates are lateral connections (Das & Gilbert, 1999 on V1; Bodin, Mante, & Carandini, 2005 on LGN), feedforward connections (Alitto & Usrey, 2008 on LGN) and feedback connections (Angelucci et al., 2002 on V1; Nolt, Kumbhani, & Palmer, 2007 on LGN).

More than one tradition has sought an account of contrast in terms of the structure of the stimulus rather than the structure of the nervous system. Bayesian models interpret simultaneous contrast and other "illusions" as the product of the visual system's best guess at what an ambiguous retinal stimulus corresponds to in the external world (for a review see Schwartz, Hsu, & Daya, 2007). A particular case of this class of explanation, and one with a long history, is the hypothesis that equates simultaneous contrast with constancy (Ikeda, Pungrassamee, Katemake, & Hansubesai, 2006; Mollon, 2006; Monge, 1789). Models put forward by Purves et al. (Purves & Lotto, 2001, 2003) relate a constancy explanation of simultaneous contrast to a Bayesian approach more explicitly.

The study of individual differences is an under-used method of establishing relationships between different psychophysical mea-





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sures (Wimler, 2008). In the present case, if individual differences were conserved across stimulus dimensions, a simple low-level explanation for simultaneous contrast would be favoured. If not, the neural mechanisms may differ between stimulus attributes or alternatively, the mechanism may be common but its degree of instantiation for different dimensions may vary. An absence of conserved individual differences would also be compatible with empirical models of simultaneous contrast. Individual differences in visual experience, either externally or internally generated, could lead to differences in the ability to isolate elements of the visual field, or to different expectations about the configuration of objects that corresponds to the retinal image.

Little work has so far been carried out on individual differences in simultaneous contrast, but one exception has been in the dimension of luminance contrast contrast. Cannon and Fullenkamp (1993) categorised observers into three types, each type showing a characteristic pattern of response to contrast contrast stimuli. One type of observer consistently exhibited contrast suppression of the central test disc, no matter what the relative contrasts of centre and surround. Another type of observer showed some enhancement particularly for surrounds of small diameter and for central patches containing low contrast. A minority of observers fell into a third category, labelled 'enhancers,' who showed consistent enhancement of the contrast of the central test patch. Cannon and Fullenkamp used their results to explain simultaneous contrast by a combination of processes where components had different weightings in different individuals. Snowden and Hammett (1998) have also reported individual differences in perception of contrast contrast, and Dakin, Carlin, and Hemsley (2005) have reported that schizophrenics are less susceptible to contrast contrast than are the normal population.

In the present study, as well as testing the relationship between different dimensions of simultaneous contrast, we quantify the range of individual variation in multiple types of simultaneous contrast, including luminance contrast contrast. We assess and report the re-test reliabilities for each dimension of simultaneous contrast.

### 2. Methods

To minimise the variance introduced by different task demands for different stimulus dimensions, the tasks were kept as similar as possible. All used asymmetric matching as a method, and the size and the configuration of the stimuli remained constant. Each of the ten stimulus dimensions was tested in a separate block and the blocks were run in random order. Within each block, two different test patch surrounds were tested (with the exception of numerosity contrast, see footnote to Table 1); elsewhere these will be referred to as measures 1 and 2, as listed in Table 1.

## 2.1. Stimuli and apparatus

Stimuli were presented on a Sony GDM F500R graphics monitor, linearised using a Cambridge Research Systems ColorCal, and calibrated using a PR650 spectroradiometer. The monitor's refresh rate was 100 Hz, and its resolution was  $1024 \times 768$ . Experiments took place in a dark room. They were programmed in Matlab and were run using a Cambridge Research Systems VSG2/5 graphics card. Chromaticities are expressed in MacLeod and Boynton (1979) chromaticity coordinates.

For all stimulus dimensions a circular test patch of diameter 3.1° was presented on one side of the screen and a comparison patch of the same diameter on the other. The test patch was embedded in an annular surround of diameter 12.4°, and the centres of the test and comparison patches were separated by

14.0°. The viewing distance was constant at 70 cm, maintained by positioning the subject on a chin rest. Fig. 1 is a representation of the test patches and their surrounds for each stimulus dimension. The properties of all the stimuli used are given in Table 1.

A series of pilot studies determined the parameters for each stimulus dimension that led to the greatest levels of individual variation in susceptibility to simultaneous contrast (Bosten, 2008). In the case of two dimensions, the stimulus arrangement had features that need special comment:

#### 2.1.1. Luminance

The stimuli were presented on a background of a high-contrast checkerboard (Zaidi, Spehar, & Shy, 1997). The comparison patch is always potentially subject to simultaneous contrast with *its* surround. If black were chosen as its surround, then the contrast would be maximal and it would be difficult to match decremental test patches. If a mid-grey surround were chosen, then the comparison patch would disappear when it had the same luminance as the surround. The advantage of the checkerboard is that the average luminance of the comparison patch surround is a mid-grey, but the visibility of the comparison patch is preserved.

#### 2.1.2. Motion

In the motion contrast display, the test patch was moving (leftward at 1 deg s<sup>-1</sup>) rather than stationary. This arrangement was adopted to minimise the problem that subjects can judge motion relative to different frames of reference. A subject might perceive the test grating as moving relative to the moving surround but might perceive the test grating as stationary relative to the aperture caused by the border of the test patch. This ambiguity might make it difficult for the subject to judge the speed of the test grating. If the test grating is itself moving, it is in motion relative both to the moving surround grating and to its border, and the problem of contradictory percepts is thus reduced.

#### 2.2. Procedure

Subjects were instructed to indicate by pushbutton on each trial whether the test patch or the comparison patch was the greater on a particular perceptual dimension. The perceptual dimension varied according to the block and the participant indicated, according to the block, which of the test or comparison patches was lighter (luminance contrast), was of higher contrast (luminance contrast contrast and colour contrast contrast), was redder (L/(L + M) colour contrast), was more violet (S/(L + M) colour contrast), was faster in a leftward direction (motion contrast), was of higher spatial frequency (spatial frequency contrast), was rotated more anticlockwise (orientation contrast) or contained more dots (numerosity contrast). Before the first experimental session, subjects received training on discriminating the stimulus dimensions that were the most difficult. These were the two types of colour contrast, orientation contrast, motion contrast and S/(L + M) contrast contrast. In the training blocks there were real differences between test and comparison patches, and the inducing surrounds were absent. Subjects were required to give ten consecutive correct responses on each training block before proceeding further.

Within each block there were four interleaved staircases, with the staircase to be tested on each trial decided according to a series of  $4 \times 4$  Latin squares. Within each block the effects of two distinct surrounds were measured, and two staircases altered the comparison patch to converge on the subject's match to the test patch embedded in each surround. Staircases 1 and 2 converged on the subject's match when surround 1 was presented and staircases 3 and 4 when surround 2 was presented (see Table 1). Staircases 1

Degrees c.p.d. ۱۰ کار	10 7.63	40.7	80 6.06	5 0.1 log unit	3 0.06 log unit	2 0.04 log unit	1 0.02 log unit	60 4	75 6.50	45 2.46	3.5 c.p.d. ~100% Vertical 97.1 cd m <sup>-2</sup> 97.1 cd m <sup>-2</sup> <0.01 cd m <sup>-2</sup> <0.01 cd m <sup>-2</sup>
	Dots	12	45	8	4	2	1	(1) 30; (2) 53*	800*	800*	97.1 cd m <sup>-2</sup> <0.01 cd m <sup>-2</sup> 0.16°
	cycles s <sup>-1</sup>	-1	1	0.2	0.1	0.1	0.05	1	2	-2	3.6 c.p.d. ~100% Vertical 97.1 cd m <sup>-2</sup> <0.01 cd m <sup>-2</sup>
	$cd m^{-2}$	34.58	62.56	2.33	1.17	0.58	0.29	48.57	97.14	38.86	97.1 cd m <sup>-2</sup> <0.01 cd m <sup>-2</sup> 30° × 22.7° 0.65° × 0.65°
CUILLASE	Michelson	0.4	0.096	0.048	0.024	0.012	0.006	0.25	0.6	0.3	48.6 cd m <sup>-2</sup> 30° × 22.7° 0.14° × 0.14°
	S/(L + M)	0.01126	0.02086	0.0012	0.00096	0.00048	0.00024	0.0161	0.0233	0.00879	18.3 cd m <sup>-2</sup> 18.3 cd m <sup>-2</sup>
	L/(L + M)	0.641	0.689	0.006	0.0048	0.0024	0.0012	0.665	0.702	0.629	18.3 cd m <sup>-2</sup> 18.3 cd m <sup>-2</sup>
	Equivalent of Michelson	0.75	0	0.075	0.06	0.030	0.015	0.37	0.75	0.46	18.3 cd m <sup>-2</sup> 18.3 cd m <sup>-2</sup> 30° × 22.7° Equal energy white 0.49° × 0.49°
	Equivalent of Michelson	0.090	0	0600.0	0.0072	0.0036	0.0011	0.045	0.081	0.054	18.3 cd m <sup>-2</sup> 18.3 cd m <sup>-2</sup> 30° × 22.7° Equal energy white 0.14° × 0.14°
	Units	Starting position of staircases 1	and 3 Starting position of staircases 2	Step size 1	Step size 2	Step size 3	Step size 4	Test patch	Surround 1	Surround 2	Other parameters: Spatial frequency Contrast Crating orientation Maximum luminance Minimum luminance Average luminance Average luminance Dot diameter Background dimensions Background chromaticity Check dimensions Element size in contrast

**Table 1** Stimulus parameters.

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Fig. 1. Stimuli for simultaneous contrast. From top left: L/(L+M) contrast, S/(L+M) contrast, L/(L+M), S/(L+M), luminance contrast, luminance, motion, numerosity, orientation and spatial frequency.

and 3 began at the same stimulus level greater than the veridical test patch match, and staircases 2 and 4 began at the same stimulus level lower than the veridical test patch match.

On each trial the test stimulus and comparison stimulus were presented for 3 s. The subject could give his or her response at any time during the stimulus presentation or during one second following. A 500-ms high tone marked the end of the response interval and a 500-ms low tone told the subject that the response had been recorded. The step size was variable, reducing after the second, third and fifth reversals on each staircase. The step sizes are given in Table 1. A condition terminated when there had been at least 14 reversals on each pair of staircases. The entire experiment took subjects between 50 and 90 min. 96% of subjects returned to complete a second session at least 6 weeks after their first.

## 2.3. Subjects

101 subjects completed the experiment once, and 97 returned to complete a second session. 66 subjects were female and 35 were male. A large proportion of subjects were graduate students at the University of Cambridge. Their ages ranged from 19 to 75, but 92% were under 40. All had normal or corrected-to-normal visual acuity.

## 2.4. Analysis

A cumulative Gaussian psychometric function was fitted to the data from each pair of staircases in a block using the freely available software *psignifit* (Wichmann & Hill, 2001a, 2001b). The 50% point was read as the point of subjective equality from the function fitted by *psignifit*.

## 2.5. Exclusion criteria

Some of the data points gathered were classed as "erroneous" according to one of three criteria. The first was that the pair of staircases used to measure a particular data point diverged rather than converged (0.875% of the data eliminated). The second was that the subject appeared to be comparing the comparison patch with the test patch surround rather than the test patch itself (0.275% of the data eliminated). The third was that the 68% confidence intervals returned by *psignifit* (by bootstrapping with 5000 simulations) on the threshold estimate were greater than the range of the subjects' matches (1.125% of the data eliminated).

#### 2.6. Other missing data points

20 data points (0.50% of the data) were lost at the point of collection owing to subjects overrunning their allotted time or to system failures. 80 data points (1.98% of the data) were missing at the point of collection because 4 subjects did not return for a second session.

## 3. Results

## 3.1. Reliability

Reliability was established by correlating subjects' thresholds across the two experimental sessions. Intraclass correlation coefficients (*C*,1) for the 20 measures of simultaneous contrast ranged from 0.322 to 0.783. All were significant ( $p \leq 0.001$ ;  $\alpha = 0.0025$  with a Bonferroni correction for 20 tests). Correlation coefficients and their 95% confidence intervals are given in Table 2. Significant correlations between the measures of simultaneous contrast taken in the first and second sessions indicated that there are reliable individual differences in all the measures.

#### 3.2. Simultaneous contrast

No distribution of points of subjective equality was significantly different from normal (0.444  $\leq$  Kolmogorov–Smirnov  $Z \leq 1.786$ ; 0.0034  $\leq p \leq 0.989$ ;  $\alpha = 0.0025$ ). We tested each distribution of points of subjective equality for simultaneous contrast, defined as the value of the matched comparison patch being significantly different from the physical value of the test patch, in the direction away from the inducing surround. Significant simultaneous contrast effects were found in all but two measures ( $3.79 \leq t \leq 24.82$ ; p < 0.001,  $\alpha = 0.0025$ ). The exceptions were S/(L+M) contrast contrast 1 and spatial frequency contrast 1. The mean, standard deviation and range for each measure of simultaneous contrast are given in Table 3.

Each set of points of subjective equality was tested for sex differences, but no significant differences were found either in the magnitude of simultaneous contrast ( $0.035 \le t \le 2.1$ ;  $p \ge 0.04$ ,  $\alpha = 0.0025$ ), or in the variance of the points of subjective equality ( $0.005 \le F \le 6.8$ ;  $p \ge 0.01$ ,  $\alpha = 0.0025$ ). Similarly, each set of points of subjective equality was correlated with subjects' ages. There were no significant correlations between age and magnitude of

#### Table 2

Intraclass correlation coefficients (c,1) for the first and second sessions for each measure, with 95% confidence intervals. With a Bonferroni correction for 20 tests, the adjusted alpha value is 0.0025.

Туре	ICC( <i>c</i> ,1)	р	n	Lower bound of 95% confidence interval on ICC( <i>c</i> ,1)	Upper bound of 95% confidence interval on ICC( <i>c</i> ,1)
L/(L + M) contrast 1	0.437	< 0.0001	92	0.256	0.589
L/(L + M) contrast 2	0.677	< 0.0001	96	0.552	0.772
S/(L+M) contrast 1	0.577	< 0.0001	95	0.425	0.697
S/(L + M) contrast 2	0.625	< 0.0001	95	0.486	0.733
L/(L+M) 1	0.687	< 0.0001	92	0.561	0.781
L/(L + M) 2	0.712	< 0.0001	92	0.595	0.800
S/(L+M) 1	0.669	< 0.0001	84	0.532	0.772
S/(L+M) 2	0.641	< 0.0001	86	0.497	0.750
Luminance contrast 1	0.614	< 0.0001	94	0.470	0.726
Luminance contrast 2	0.470	< 0.0001	96	0.298	0.612
Luminance 1	0.782	< 0.0001	92	0.688	0.851
Luminance 2	0.680	< 0.0001	92	0.553	0.776
Motion 1	0.741	< 0.0001	91	0.632	0.821
Motion 2	0.666	< 0.0001	83	0.527	0.771
Numerosity 1	0.450	< 0.0001	91	0.269	0.599
Numerosity 2	0.471	< 0.0001	92	0.295	0.615
Orientation 1	0.530	< 0.0001	87	0.630	0.666
Orientation 2	0.591	< 0.0001	87	0.435	0.712
Spatial frequency 1	0.321	0.001	94	0.127	0.491
Spatial frequency 2	0.616	<0.0001	93	0.472	0.728

simultaneous contrast (0.007  $\leq r_p \leq$  0.216, 0.033  $\leq p \leq$  0.943,  $\alpha = 0.0025 \ n = 97$ ).

#### 3.3. Correlations between stimulus dimensions

Table 4 shows a matrix of correlations across all dimensions. The input to the correlation matrix was the points of subjective equality for each measure averaged for each subject across the two sessions, or from a single session if there was only one value available. The correlations are colour-coded by magnitude. Those that are significant following a Bonferroni correction for 190 tests  $(\alpha = 0.00026)$  are indicated in dark grey. Lower correlations (p < 0.01) are indicated in mid-grey, and correlations that are lower still (p < 0.05) are indicated in light grey. The most striking result is that susceptibility to simultaneous contrast does not generally correlate across stimulus dimensions: if a subject is particularly susceptible to one type of simultaneous contrast, he or she is not necessarily particularly susceptible to other types. Most correlation coefficients are very low indeed: 27.9% of coefficients are below 0.05 and 53% of coefficients are below 0.1. The preponderance of low correlations means that a factor analysis is inappropriate.

There are a small number of exceptions to the trend of low correlations: 13 correlations (6.5%) are significant. Eight of these are intercorrelations between the three types of contrast contrast (0.394  $\leq r_p \leq 0.721$ ; p < 0.0001). The others are between the two measures of spatial frequency contrast ( $r_p = 0.374$ , p = 0.0001), between the two measures of numerosity contrast ( $r_p = 0.469$ , p < 0.0001), between L/(L+M) contrast and S/(L+M) contrast where the test patches were decrements ( $r_p = 0.397$ , p < 0.0001), between luminance contrast and S/(L+M) contrast contrast ( $r_p = 0.364$ , p = 0.0002) and between L/(L+M) contrast contrast and spatial frequency contrast ( $r_p = 0.376$ , p = 0.0001).

The fact that the number of significant correlations is small is not, alone, very surprising. With 100 subjects and the necessity of performing a Bonferroni correction for 190 tests (lowering alpha to 0.00026), our study had sufficient power to detect only large effect sizes. Power calculations revealed that with an alpha of 0.00026, and 100 subjects we could expect to find a correlation

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Mean, standard deviation and range of points of subjective equality for each measure of simultaneous contrast.

Туре	Units	Mean point of subjective equality	Standard Deviation	Range
L/(L + M) contrast 1 contrast 1	Equivalent of Michelson contrast	0.0298	0.00596	0.0110-0.0453
L/(L + M) contrast 2 contrast 2		0.0353	0.00690	0.0114-0.0622
S/(L + M) contrast 1 contrast 1	Equivalent of Michelson contrast	0.334	0.107	0.0530-0.842
S/(L + M) contrast 2 contrast 2		0.327	0.0707	0.0556-0.573
L/(L + M) 1	L/(L + M)	0.660	0.00450	0.647-0.670
L/(L + M) 2		0.671	0.00474	0.662-0.683
S/(L+M) 1	S/(L + M)	0.0137	0.00144	0.00921-0.0165
S/(L + M) 2		0.0169	0.00149	0.0135-0.0226
Luminance contrast 1	Michelson contrast	0.190	0.0434	0.103-0.354
Luminance contrast 2		0.196	0.0283	0.083-0.249
Luminance 1	$cd m^{-2}$	40.2	4.71	25.3-54.3
Luminance 2		56.9	5.13	47.4-69.0
Motion 1	cycles s <sup>-1</sup>	0.643	0.292	-0.711-1.73
Motion 2		1.20	0.515	-0.615-2.37
Numerosity 1	dots	25.2	1.98	18.2-30.1
Numerosity 2		49.0	2.93	42.7-60.1
Orientation 1	degrees	54.3	4.26	44.7-64.7
Orientation 2		67.8	4.80	56.3-79.9
Spatial frequency 1	c.p.d.	3.94	0.205	3.28-4.83
Spatial frequency 2		4.11	0.260	3.40-4.91

of  $r_p$  = 0.43 with a power of 80%. However, statistical power depends not only on sample size, alpha value and effect size, but also on the level of noise present in the data. In other words, the *true* correlation between two variables is weakened in the *observed* correlation by the level of noise present in the measurements of each variable. The following equation allows estimation of the "true" correlation given the observed correlation and the reliabilities of each of the two correlated variables *X* and *Y*:

$$r_{\rm o} = r_{\rm t} / (R_{\rm x} R_{\rm y})^{1/2} \tag{1}$$

where  $r_o$  is the observed correlation,  $r_t$  is the "true" correlation, and  $R_x$  and  $R_y$  are the coefficients of reliability for the variables *X* and *Y*.<sup>1</sup>

Since the correlations between dimensions of simultaneous contrast were performed using the data averaged across two sessions, we used the intraclass correlation coefficient (c,1) for the average of two measures to give us the coefficients of reliability for each dimension. We were then able to estimate the minimum expected "true" correlations given 80% power, 100 subjects and an alpha value of 0.00026 from Eq. (1). These ranged, depending on the reliabilities for each measure of simultaneous contrast, from 0.5 to 0.78. The true power of our study to detect significant correlations, was therefore limited to large effect sizes.

It is more informative to look at the distribution of all 190 correlations between our 20 measures of simultaneous contrast. If there were such a thing as a general trait of susceptibility to simultaneous contrast, we should expect the distribution of correlations to be centred on the mean observed effect size. The distribution of the 190 correlations between measures of simultaneous contrast is shown in Fig. 2 (red line). Because on some scales a large amount of simultaneous contrast would reveal itself by reduced scores, whereas on others a large amount of simultaneous contrast would give enhanced scores (see Table 1), if there were a general trait of susceptibility to simultaneous contrast, we should expect the correlations between some measures of simultaneous contrast to be positive and others to be negative. We therefore reflected the correlations we expected to be negative about the line  $r_p = 0$  before including them in Fig. 2. The distribution of observed correlations (red, Fig. 2) includes many correlations that are negative (even following the transformation described above), and many that are zero or near-zero. The mean of the distribution is 0.081, its standard deviation is 0.17, and its peak is at 0 with histogram bins of width 0.05. An estimate of the distribution of "true" correlations may be obtained by transforming the distribution of observed correlations according to Eq. (1). The distribution of projected "true" correlations is shown in Fig. 2 in blue. The distribution's mean is 0.11, its standard deviation is 0.23 and its peak is at 0–0.1.

How do the distributions of observed and "true" correlations compare with distributions of correlations among variables consisting entirely of random noise? To answer this question we ran Monte-Carlo simulations correlating random pairs of data points rather than data points gathered from the same subjects. One hundred simulations from random permutations were made and the results are also shown in Fig. 2. The solid black line shows the average distribution of correlations across all the simulations, and the dashed lines show the maximum and minimum number of correlations of each level that occurred in any simulation. The Monte-Carlo simulation can be compared with the observed and estimated "true" distributions of correlations shown in red and blue, respectively. It is clear from the figure that the observed distribution of correlations overlaps largely with the distribution expected by chance, but there is a positive arm of the distribution that falls outside the distribution expected by chance. The number of positive correlations falling outside the distribution expected by chance is increased, as would be expected, when the "true" correlations are estimated.

## 4. Discussion

Although there are significant differences in susceptibility to simultaneous contrast apparent in each individual measure, this susceptibility, with few exceptions, does not give rise to significant correlations between measures. The three measures of contrast contrast intercorrelate significantly, and S/(L+M) contrast and L/(L+M) contrast are correlated significantly when surrounds in both cases had a higher value than the test patch. Few other dimensions of simultaneous contrast intercorrelate significantly.

The distribution of the 190 correlations obtained between our measures of simultaneous contrast indicates that many correla-

<sup>&</sup>lt;sup>1</sup> The coefficient of reliability is the proportion of variance that is shared across the two or more sessions of measuring the variables *X* and *Y*. When we are measuring the reliability of individual differences, the numerator of this ratio is the variance attributable to true individual differences. The total variance (the denominator of the ratio) is the sum of the variance attributable to true individual differences and the variance attributable to true individual differences.

spatial frequency 2	0.286 0.00390	0.330 0.000745	0.187 0.0610	0.206 0.0383	-0.047 0.645	-0.054 0.596	0.0008 0.994	0.098 0.331	0.047 0.644	0.1418 0.157	0.143 0.156	-0.078 0.442	-0.064 0.522	-0.189 0.060	0.00569 0.955	-0.121 0.231	-0.029 0.774	-0.034 0.733	0.374 0.000116
spatial frequency 1	0.376 0.000113	0.206 0.0390	0.327 0.000858	0.277 0.00502	0.016 0.876	-0.173 0.085	0.0703 0.485	-0.153 0.125	0.281 0.00446	0.0216 0.830	0.212 0.0346	0.058 0.563	0.290 0.00322	-0.223 0.0256	-0.0502 0.620	-0.086 0.396	0.169 0.091	-0.077 0.442	
orientation 2	-0.117 0.246	-0.170 0.090	0.183 0.0677	0.106 0.291	0.015 0.879	-0.077 0.449	-0.1241 0.216	0.038 0.706	-0.175 0.080	-0.1903 0.057	0.158 0.115	0.089 0.381	-0.018 0.856	0.076 0.454	-0.169 0.0929	-0.095 0.346	-0.204 0.0409		
/ orientation 1	0.040 0.691	0.025 0.803	0.089 0.377	0.045 0.654	0.065 0.522	0.076 0.453	0.0256 0.799	-0.054 0.594	0.150 0.133	-0.0743 0.460	0.089 0.379	0.050 0.622	-0.040 0.691	-0.160 0.111	0.0123 0.904	-0.013 0.898			
numerosity 2	0.112 0.272	0.045 0.659	0.234 0.0189	0.160 0.113	-0.058 0.568	-0.043 0.674	0.0403 0.691	-0.173 0.085	0.169 0.092	0.1066 0.291	-0.050 0.626	-0.154 0.128	-0.166 0.099	0.037 0.714	0.469 <0.0001				
numerosity 1	0.120 0.237	0.082 0.417	0.086 0.393	0.111 0.271	-0.160 0.114	-0.043 0.676	-0.0431 0.670	-0.158 0.115	0.220 0.0275	0.1523 0.130	0.031 0.763	-0.171 0.090	0.002 0.981	0.036 0.723					
motion 2	-0.143 0.158	-0.016 0.875	0.084 0.406	0.066 0.512	-0.044 0.667	0.060 0.556	0.0945 0.350	0.128 0.205	-0.055 0.588	0.0218 0.830	-0.067 0.507	0.281 0.00477	0.024 0.815						
notion 1	-0.007 0.941	-0.082 0.414	0.038 0.704	0.018 0.856	0.114 0.259	-0.205 0.0403	0.0101 0.920	-0.221 0.0265	0.019 0.852	-0.2017 0.0431	0.095 0.346	0.178 0.0767							
luminance 2	-0.001 0.989	-0.171 0.089	0.154 0.127	-0.086 0.396	0.189 0.060	-0.034 0.735	0.1273 0.207	0.050 0.622	-0.032 0.755	-0.2515 0.0116	0.150 0.135								
luminance 1	0.196 0.052	0.193 0.054	0.364 0.000197	0.276 0.00536	0.183 0.069	-0.240 0.0165	0.2086 0.0373	-0.300 0.00245	0.298 0.00264	0.0216 0.831									
contrast contrast 2	0.216 0.03106	0.519 <0.0001	0.084 0.402	0.332 0.000685	-0.034 0.740	0.235 0.0186	-0.0511 0.612	0.053 0.599	0.295 0.00272										
contrast contrast 1	0.412 <0.0001	0.270 0.00641	0.238 0.0163	0.156 0.118	0.132 0.191	-0.034 0.737	0.223 0.0249	-0.144 0.151											
S/(L+M) 2	-0.057 0.574	0.077 0.446	0.055 0.585	0.00 0.998	0.045 0.655	0.124 0.218	-0.014 0.886												
S/(L+M) 1	0.182 0.070	0.109 0.277	0.067 0.503	0.043 0.668	0.397<0.0001	-0.309 0.00175													
L/(L+M) 2	-0.133 0.191	0.000 0.9999	-0.106 0.295	0.027 0.791	-0.100 0.320														
1 L/(L+M)	0.161 0.112	0.111 0.273	0.049 0.627	-0.025 0.808															
<ol> <li>S/(L+M)</li> <li>st contrast</li> <li>st contrast</li> <li>2</li> </ol>	0.408 1 <0.0001	t 0.574 11 <0.0001	0.721 <0.0001											p < 0.000263 significant	p < 0.01	p < 0.05			
<ul> <li>A) S/(L+N</li> <li>Nat contra</li> <li>1</li> </ul>	8 0.458 01 <0.000	0.394 <0.000																	
L/(L+N contra contra 2	r 0.538 p <0.000	r P	r P	r p	r P	r P	r P	r P	r P	r P	r P	r P	r P	r P	ь г	r P	r P	r P	r P
	L/(L+M) contrast 1	L/(L+M) contrast 2	S/(L+M) contrast 1	S/(L+M) contrast 2	L/(L+M) 1	L/(L+M) 2	S/(L+M) 1	S/(L+M) 2	Luminance constrast 1	Luminance contrast 2	luminance 1	luminance 2	motion 1	motion 2	numerosity 1	numerosity 2	orientation 1	orientation 2	spatial frequency 1

 Table 4

 Pearson's Correlations between dimensions of simultaneous contrast.



Fig. 2. Distributions of observed and "true" correlations, and the range of distributions of correlations expected by chance. The distribution of observed correlations between measures of simultaneous contrast is shown in red, with those expected to be negative reflected about  $r_p = 0$ . The distribution of calculated "true" correlations is shown in blue. The results of Monte-Carlo simulations to determine the distribution of correlations expected from random noise are indicated by the black lines. The mean of 100 simulations is indicated by the solid black line, and the maximum and minimum number of correlations of each level that occurred in any simulation are indicated by the black dashed lines.

tions between measures of simultaneous contrast are negative or near-zero. An estimation of the distribution of "true" correlations has shown that a general effect, if it exists, must be very small ( $r_p \leq 0.11$ ). There may be a very small general trait of susceptibility to simultaneous contrast, accounting for around 1% of the variance in each measure. However, a subset of correlations are larger: some dimensions of simultaneous contrast intercorrelate better than others, for example, the different measures of simultaneous contrast contrast.

What can be concluded from the general absence of correlations between individuals' settings on different dimensions of simultaneous contrast? One basic conclusion is that there is no noteworthy general trait of susceptibility. It thus seems unlikely that individual differences in all the different dimensions can be accounted for by conserved variation in one neural property such as the density or the extent of lateral connections or the gain control exercised by synapses on postsynaptic cells or the spatial precision of descending attentional processes that allow a particular region of the visual field to be isolated. Our results do not rule out the possibility that individual differences in contrast on particular dimensions are caused by variations in such neural properties: genetic polymorphisms or environmental influences might determine the operating parameters of neural mechanisms that are essentially similar - for example, the growth of lateral connections could be terminated at different developmental points in different visual subsystems and this timing could be different for different individuals. But our results would also be consistent with empirical accounts that attribute simultaneous contrast to learnt expectations about the visual world. Such learning would be free to progress independently in different individuals for each stimulus dimension.

#### Acknowledgments

Supported by a Gatsby Foundation Grant to J. Mollon, R. Durbin and G. Mitchison. J. Bosten was a Medical Research Council research student.

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